

## Claims

WHAT IS CLAIMED IS:

1. A method comprising:

generating derivatives of a nonlinear invariance transformation at a training data point with respect to a transformation parameter, the training data point representing one of a plurality of training patterns; and

generating a classifier representation based on the derivatives for classifying a test pattern in the presence of the nonlinear invariance transformation.

2. The method of claim 1 further comprising:

classifying the test pattern based on the classifier representation.

3. The method of claim 1 further comprising:

receiving the plurality of training patterns; and

characterizing one of the training patterns to provide the training data point.

4. The method of claim 1 further comprising:

classifying the test pattern based on the classifier representation to provide a classification signal; and

inputting the test pattern to the operation of generating derivatives as a training pattern, responsive to the classifying operation.

5. The method of claim 1 further comprising:

classifying the test pattern based on the classifier representation to provide a classification signal;

1           inputting the test pattern to the operation of generating derivatives as a  
2 training pattern; and

3           inputting the classification signal to the operation of generating derivatives  
4 in association with the test pattern.  
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1           6. The method of claim 1 wherein the non-linear invariant transformation  
2 is represented by a Taylor expansion polynomial.

3           7. The method of claim 1 wherein the nonlinear invariance transformation  
4 models a rotation of an individual training pattern.

5           8. The method of claim 1 wherein the nonlinear invariance transformation  
6 models a sheering in an individual training pattern.

7           9. The method of claim 1 wherein the nonlinear invariance transformation  
8 models a translation in an individual training pattern.

9           10. The method of claim 1 wherein the nonlinear invariance transformation  
10 models a change in lighting angle in an individual training pattern.

11           11. The method of claim 1 wherein the nonlinear invariance transformation  
12 models a change in brightness in an individual training pattern.

13           12. The method of claim 1 wherein the nonlinear invariance transformation  
14 models a scaling of an individual training pattern.

15           13. The method of claim 1 wherein the nonlinear invariance transformation  
16 models a change in line thickness in an individual training pattern.

17           14. The method of claim 1 wherein the nonlinear invariance transformation  
18 models a change in frequency composition of an individual training pattern.

19           15. The method of claim 1 wherein the nonlinear invariance transformation  
20 models a change in duration of an individual training pattern.

- 1 16. The method of claim 1 wherein the test pattern includes an image.
- 2 17. The method of claim 1 wherein the test pattern includes an audio input.
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- 4 18. The method of claim 1 wherein the test pattern includes a handwriting
- 5 pattern.
- 6 19. The method of claim 1 wherein the test pattern includes a time series.
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- 8 20. The method of claim 1 further comprising:
- 9 restricting a range of the transformation parameter to a closed interval on a
- 10 line of real numbers.
- 11 21. The method of claim 1 further comprising:
- 12 representing a scalar product of the classifier representation with the
- 13 derivatives of the nonlinear invariance transformation at the training data point
- 14 with respect to the transformation parameter by a nonlinear positive definite real-
- 15 valued kernel function.
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- 17 22. The method of claim 1 wherein the operation of generating derivatives
- 18 comprises:
- 19 generating derivatives of the nonlinear invariance transformation at the
- 20 training data point with respect to a plurality of transformation parameters.
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1           23. A computer program product encoding a computer program for  
2           executing on a computer system a computer process, the computer process  
3           comprising:

4           generating derivatives of a nonlinear invariance transformation at a training  
5           data point with respect to a transformation parameter, the training data point  
6           representing one of a plurality of training patterns; and

7           generating a classifier representation based on the derivatives for  
8           classifying a test pattern in the presence of the nonlinear invariance  
9           transformation.

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11           24. The computer program product of claim 23 wherein the computer  
12           process further comprises:

13           classifying the test pattern based on the classifier representation.

14           25. The computer program product of claim 23 wherein the computer  
15           process further comprises:

16           receiving the plurality of training patterns; and

17           characterizing one of the training patterns to provide the training data point.

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19           26. The computer program product of claim 23 wherein the computer  
20           process further comprises:

21           classifying the test pattern based on the classifier representation; and

22           inputting the test pattern to the operation of generating derivatives as a  
23           training pattern, responsive to the classifying operation.

1           27. The computer program product of claim 23 wherein the computer  
2 process further comprises:  
3           classifying the test pattern based on the classifier representation to provide  
4 a classification signal;  
5           inputting the test pattern to the operation of generating derivatives as a  
6 training pattern; and  
7           inputting the classification signal to the operation of generating derivatives  
8 in association with the test pattern.

9           28. The computer program product of claim 23 wherein the non-linear  
10 invariant transformation is represented by a Taylor expansion polynomial.

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12           29. The computer program product of claim 23 wherein the nonlinear  
13 invariance transformation models a rotation of an individual training pattern.

14           30. The computer program product of claim 23 wherein the nonlinear  
15 invariance transformation models a sheering in an individual training pattern.

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17           31. The computer program product of claim 23 wherein the nonlinear  
18 invariance transformation models a translation in an individual training pattern.

19           32. The computer program product of claim 23 wherein the nonlinear  
20 invariance transformation models a change in lighting angle in an individual  
21 training pattern.

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23           33. The computer program product of claim 23 wherein the nonlinear  
24 invariance transformation models a change in brightness in an individual training  
25 pattern.

1           34. The computer program product of claim 23 wherein the nonlinear  
2 invariance transformation models a scaling of an individual training pattern.

3           35. The computer program product of claim 23 wherein the nonlinear  
4 invariance transformation models a change in line thickness in an individual  
5 training pattern.

6           36. The computer program product of claim 23 wherein the nonlinear  
7 invariance transformation models a change in frequency composition of an  
8 individual training pattern.

9           37. The computer program product of claim 23 wherein the nonlinear  
10 invariance transformation models a change in duration of an individual training  
11 pattern.

12           38. The computer program product of claim 23 wherein the test pattern  
13 includes an image.

14           39. The computer program product of claim 23 wherein the test pattern  
15 includes an audio input.

16           40. The computer program product of claim 23 wherein the test pattern  
17 includes a handwriting pattern.

18           41. The computer program product of claim 23 wherein the test pattern  
19 includes a time series.

1           42. The computer program product of claim 23 wherein the computer  
2 process further comprises:  
3           restricting a range of the transformation parameter to a closed interval on a  
4 line of real numbers.

5           43. The computer program product of claim 23 wherein the computer  
6 process further comprises:  
7           representing a scalar product of the classifier representation with the  
8 derivatives of the nonlinear invariance transformation at the training data point  
9 with respect to the transformation parameter by a nonlinear positive definite real-  
10 valued kernel function.

11           44. The computer program product of claim 23 wherein the operation of  
12 generating derivatives comprises:  
13           generating derivatives of the nonlinear invariance transformation at the  
14 training data point with respect to a plurality of transformation parameters.  
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1 45. A system comprising: /

2 a derivative generator generating derivatives of a nonlinear invariance  
3 transformation at a training data point with respect to a transformation parameter,  
4 the training data point representing one of a plurality of training patterns; and

5 a classifier representation generator generating a classifier representation  
6 based on the derivatives for classifying a test pattern in the presence of the  
7 nonlinear invariance transformation.

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9 46. The system of claim 45 further comprising:

10 a classifier classifying the test pattern based on the classifier representation.

11 a training data characterizer receiving the plurality of training patterns and  
12 characterizing one of the training patterns to provide the training data point.

13 47. The system of claim 45 wherein the derivative generator inputs the test  
14 pattern as a training pattern.

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16 48. The system of claim 45 further comprising:

17 a classifier classifying the test pattern based on the classifier representation  
18 to provide a classification signal, wherein the derivative generator inputs the test  
19 pattern as a training pattern and inputs the classification signal in association with  
20 the test pattern.

21 49. The system of claim 45 wherein the non-linear invariant transformation  
22 is represented by a Taylor expansion polynomial.

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24 50. The system of claim 45 wherein the test pattern includes an image.  
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1 51. The system of claim 45 wherein the test pattern includes an audio input.

2 52. The system of claim 45 wherein the test pattern includes a handwriting  
3 pattern.

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5 53. The system of claim 45 wherein the test pattern includes a time series.

6 54. The system of claim 45 wherein a range of the transformation parameter  
7 is restricted to a closed interval on a line of real numbers.

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9 55. The system of claim 45 wherein a nonlinear positive definite real-valued  
10 kernel function represents a scalar product of the classifier representation with the  
11 derivatives of the nonlinear invariance transformation at the training data point  
12 with respect to the transformation parameter.

13 56. The system of claim 45 wherein the classifier representation generator  
14 generates derivatives of the nonlinear invariance transformation at the training  
15 data point with respect to a plurality of transformation parameters.

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1           57. A method comprising: ✓  
2           characterizing a plurality of training patterns, each training pattern  
3           corresponding to a training data point in a feature space;  
4           determining a classification for each training pattern;  
5           generating derivatives of a nonlinear invariance transformation at  
6           individual training data points with respect to a transformation parameter; and  
7           generating an optimized weight vector, based on the derivatives and the  
8           classification of each training pattern, for classifying a test pattern in the presence  
9           of the nonlinear invariance transformation.  
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11           58. The method of claim 57 further comprising:

12           classifying the test pattern based on the optimized weight vector.

13           59. The method of claim 57 further comprising:

14           classifying the test pattern based on the optimized weight vector to provide  
15           a classification signal; and

16           inputting the test pattern to the operation of generating derivatives as a  
17           training pattern, responsive to the classifying operation.  
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19           60. The method of claim 57 further comprising:

20           classifying the test pattern based on the optimized weight vector to provide  
21           a classification signal;

22           inputting the test pattern to the operation of generating derivatives as a  
23           training pattern; and

24           inputting the classification signal to the operation of generating derivatives  
25           in association with the test pattern.

1           61. The method of claim 57 wherein the non-linear invariant transformation  
2 is represented by a Taylor expansion polynomial.

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1           62. A computer program product encoding a computer program for  
2           executing on a computer system a computer process, the computer process  
3           comprising:  
4                 characterizing a plurality of training patterns, each training pattern  
5                 corresponding to a training data point in a feature space;  
6                 determining a classification for each training pattern;  
7                 generating derivatives of a nonlinear invariance transformation at  
8                 individual training data points with respect to a transformation parameter; and  
9                 generating an optimized weight vector, based on the derivatives and the  
10                classification of each training pattern, for classifying a test pattern in the presence  
11                of the nonlinear invariance transformation.

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13           63. The computer program product of claim 62 wherein the computer  
14           process further comprises:

15                 classifying the test pattern based on the optimized weight vector.

16           64. The computer program product of claim 62 wherein the computer  
17           process further comprises:

18                 characterizing one of the training patterns to provide the training data point.

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20           65. The computer program product of claim 62 wherein the computer  
21           process further comprises:

22                 classifying the test pattern based on the optimized weight vector; and

23                 inputting the test pattern to the operation of generating derivatives as a  
24                 training pattern, responsive to the classifying operation.

1           66. The computer program product of claim 62 wherein the computer  
2 process further comprises:  
3           classifying the test pattern based on the optimized weight vector to provide  
4 a classification signal;  
5           inputting the test pattern to the operation of generating derivatives as a  
6 training pattern; and  
7           inputting the classification signal to the operation of generating derivatives  
8 in association with the test pattern.

9           67. The computer program product of claim 62 wherein the non-linear  
10 invariant transformation is represented by a Taylor expansion polynomial.  
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1           68. A system comprising: /

2           a training data characterizer characterizing a plurality of training patterns,  
3 each training pattern corresponding to a training data point in a feature space and  
4 determining a classification for each training pattern;

5           a derivative generator generating derivatives of a nonlinear invariance  
6 transformation at individual training data points with respect to a transformation  
7 parameter; and

8           a classifier representation generator generating an optimized weight vector,  
9 based on the derivatives and the classification of each training pattern, for  
10 classifying a test pattern in the presence of the nonlinear invariance  
11 transformation.

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13          69. The system of claim 68 further comprising:

14          a classifier classifying the test pattern based on the classifier representation.

15          70. The system of claim 68 further comprising:

16          a training data characterizer receiving the plurality of training patterns and  
17 characterizing one of the training patterns to provide the training data point.

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19          71. The system of claim 68 wherein the derivative generator inputs the test  
20 pattern as a training pattern.

21          72. The system of claim 68 further comprising:

22          a classifier classifying the test pattern based on the classifier representation  
23 to provide a classification signal, wherein the derivative generator inputs the test  
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1 pattern as a training pattern and inputs the classification signal in association with  
2 the test pattern.

3 73. The system of claim 68 wherein the non-linear invariant transformation  
4 is represented by a Taylor expansion polynomial.  
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